

# CoSense

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Palo Alto Research Center, Inc. (PARC)  
(formerly, Xerox Palo Alto Research Center)

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# PARC CoSense Project:

## *Collaborative Sensemaking of Distributed Sensor Data for Target Recognition and Condition Monitoring*

### PARC SITEX02 Objectives

- Experiment on IDSQ tracker for single vehicle, 2D tracking
- Data collection of single/multiple vehicle runs for lab experiment

### SITEX02 Results

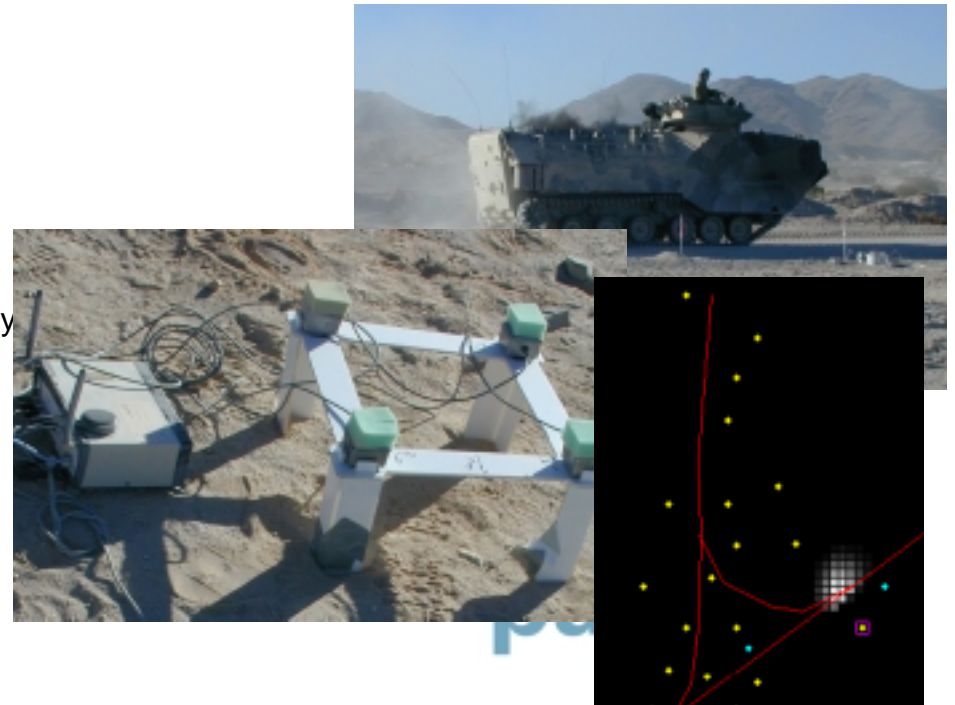
- IDSQ tracker
  - On site: 4-node test completed
  - In lab: 21-node test on SITEX02 data
- Beamformer (DOA)
  - 7 beamformers constructed
  - DOA algorithm tested (in collaboration with UCLA/Yao)
- Data collection
  - 3GB wideband data on tank, aav, humvee
  - 17MB detection data on aav and other targets of opportunity
- Service
  - Made and installed 32 microphone windscreens
  - Calibrated 32 microphone gains

### Publications

- co-edited a special issue on CSIP
- 5 journal papers (3 accepted, 2 submitted)/6 invited talks/2 major press coverages

### Methodologies

- Information-driven data diffusion
  - Maximize information gain while minimizing resource use
  - Energy-aware, lower latency
- IDSQ tracking
  - Non-CPA based, no road constraints, 2D tracking
  - Combine acoustic amplitude sensing with DOA estimates



# PARC IDSQ Tracker in Action



**SensIT Experiment (video)**, 29  
Palms, MCAGCC, November 2001

**Tracking result (right)** from  
post-processing acoustic  
amplitude data from 21 Sensoria  
wireless nodes (yellow dots).

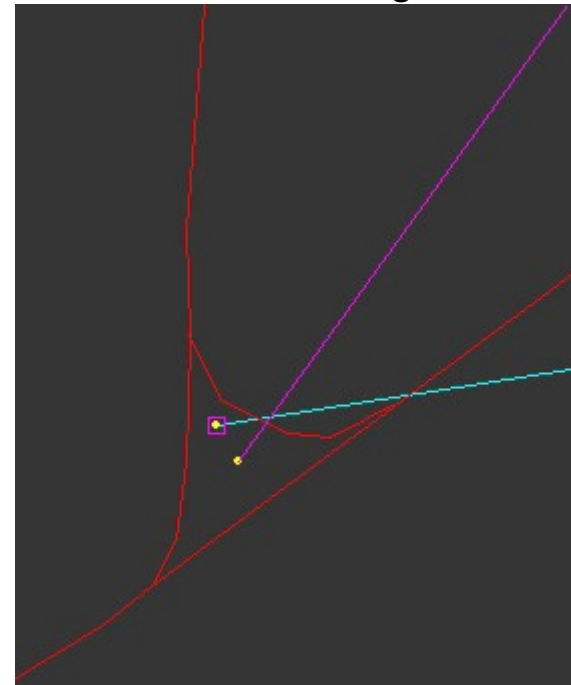
# Beamforming (Direction-of-arrival estimation)



A 4-microphone beamformer



Seven beamformers deployed at SITEX02, with an AAV in the background.

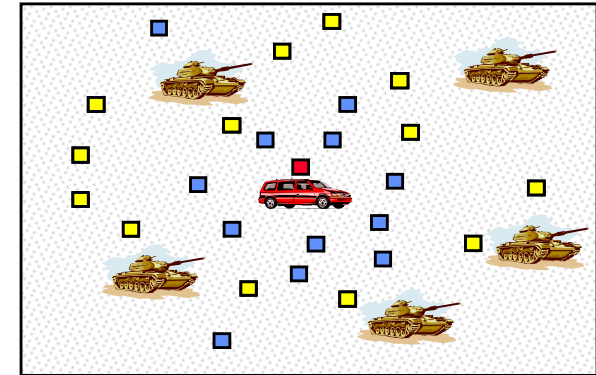


Two beams cross to locate a vehicle

# Collaborative Sensemaking (CoSense): What are we trying to do?



Track multiple moving targets:  
Which vehicle came from where?



Reason about global relations:  
“Am I surrounded?”

## Enable resource-aware, information-optimal sensor collaboration

- Problem: Tracking *non-local* spatio-temporal events or *low-observable* events
- Approach: Enable sensors to self-organize into *collaboration regions* based on information and resource constraints



Track groups: “Where is the group heading?” “How big is it?”

A central problem: scalable mechanism  
to mediate between data and queries

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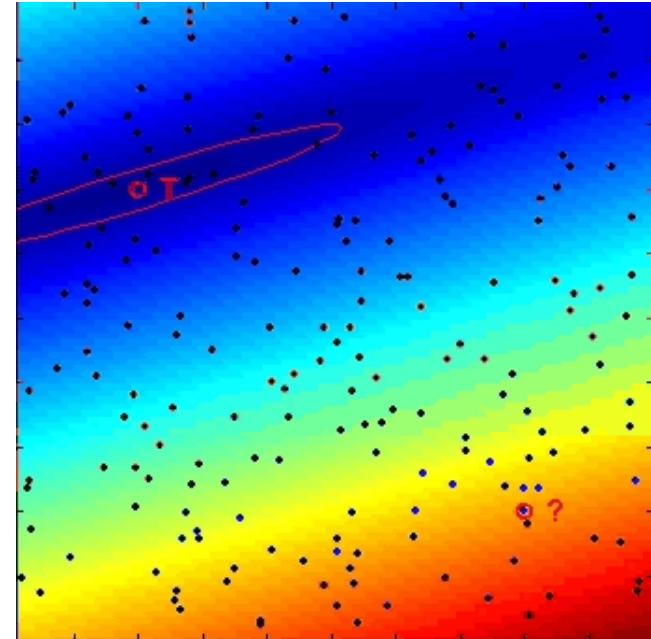
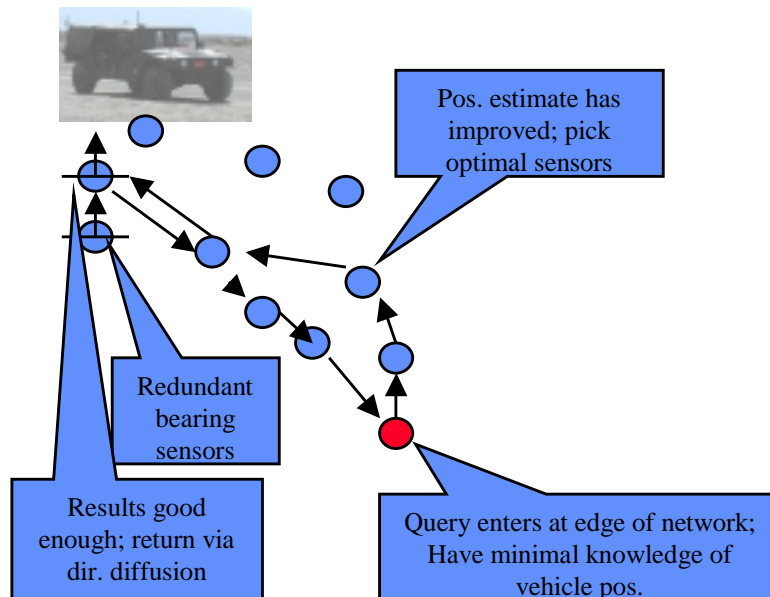
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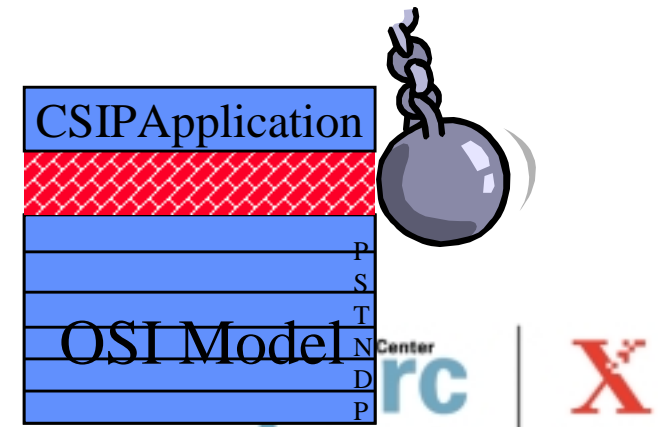
# Actively Seek Out Information

“Find the intruder” (minimize energy usage)



Break the barrier between *application* layer and *routing*

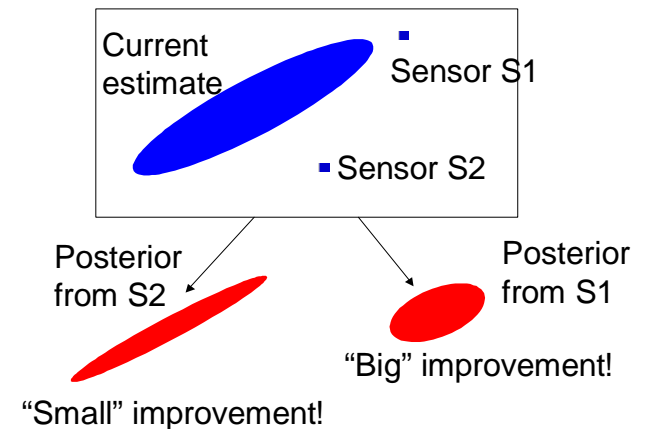
- Pick best info source considering **network cost** and **information utility**
- Implement selection **in network**, via routing decision.



# IDSQ: Information Utility Measure

Select next sensor to collaborate so as to *maximize information* return while *minimizing latency & bandwidth* consumption

- Routing protocol to automatically direct a sensor query into regions of high information content (information utility measure)
- Tradeoff between maximum information gain and minimum transmission cost



**Define dynamic constraints:**

$$H(\vec{x}) = \alpha (\vec{x} - \vec{x}_T)^T \hat{\Sigma}^{-1} (\vec{x} - \vec{x}_T) + (1 - \alpha) (\vec{x} - \vec{x}_S)^T (\vec{x} - \vec{x}_S)$$

*Information utility:*  
*Mahalanobis Distance*

*Energy utility:*  
*Query path length*

$\vec{x}$  Routing node position

$\vec{x}_T$  Target position

$\vec{x}_S$  Querying sensor position

$\alpha$  "Tradeoff" parameter

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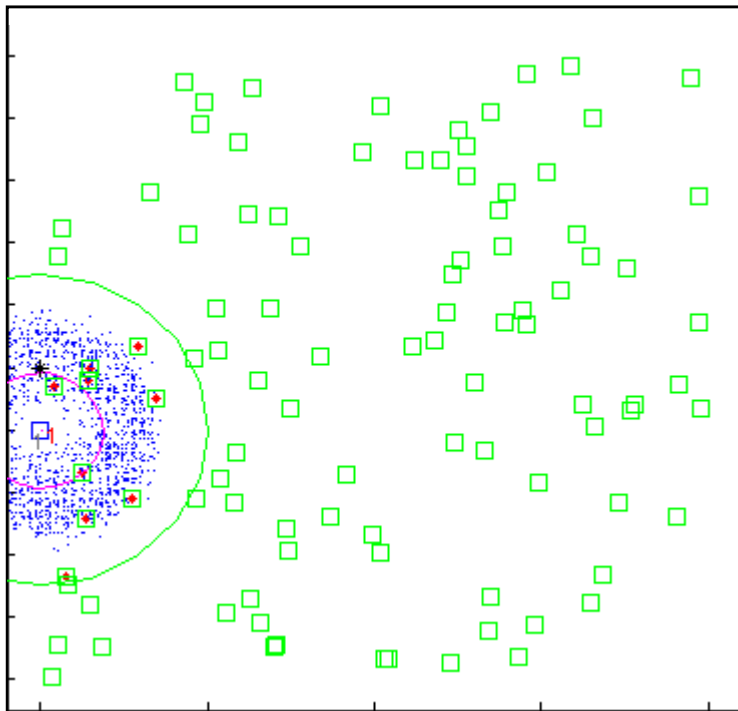
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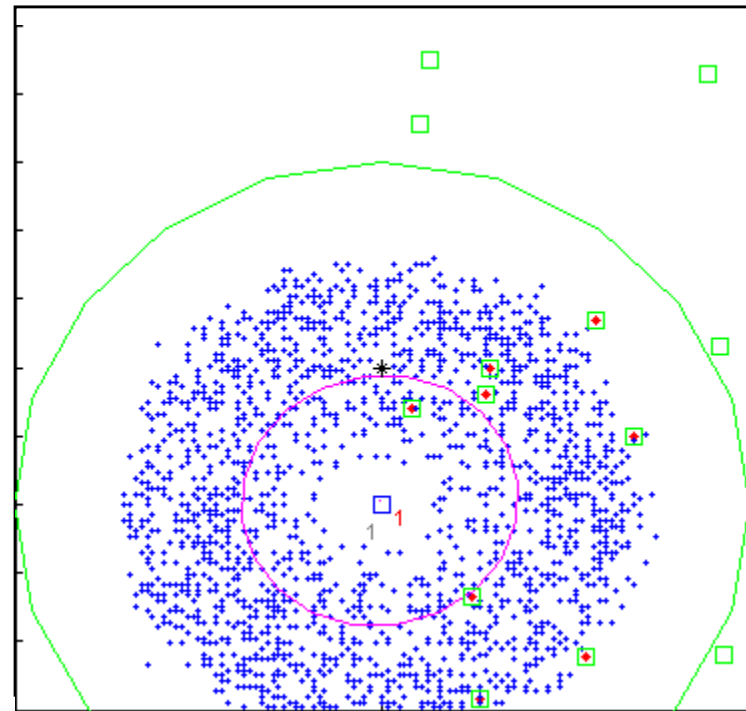
# Tracking Moving Object

Only the leader node (blue square) carries belief state

- Choose sensor in the neighborhood with good information
- Hand off current belief to chosen sensor (new leader) and update belief



Target moving in straight line; Tracking using a sequential Monte Carlo algorithm



Close-up of target (particles show velocity vectors)

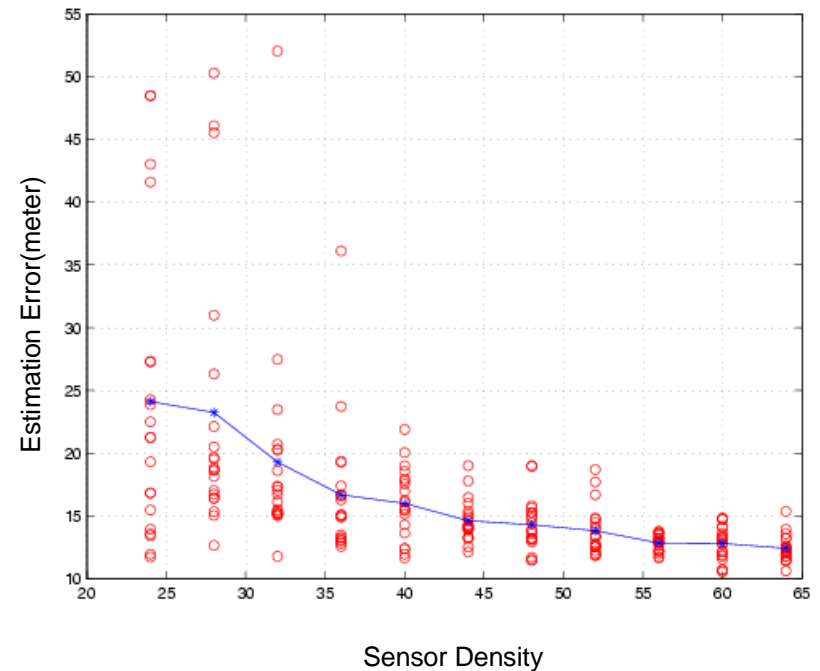
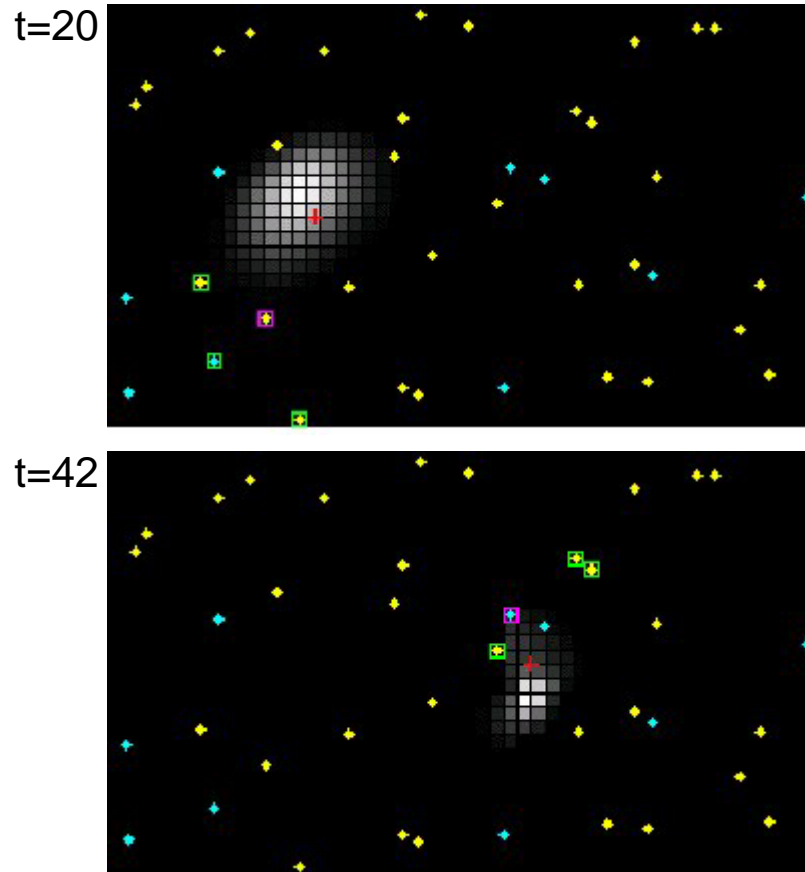
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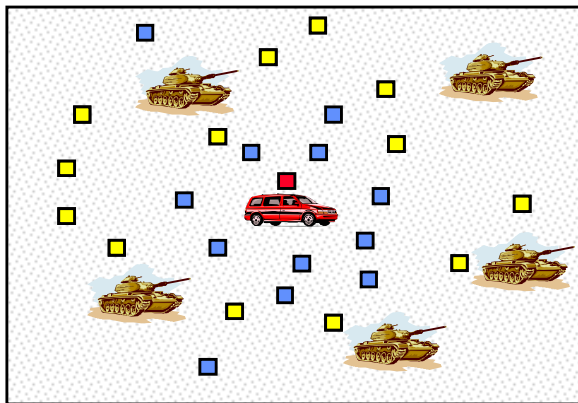
# How track quality varies with sensor density



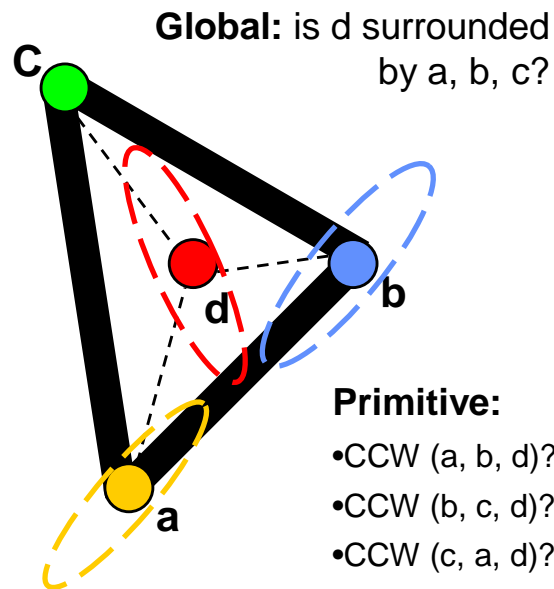
# Tracking Geometric Relations

Answer queries regarding global relation between multiple objects

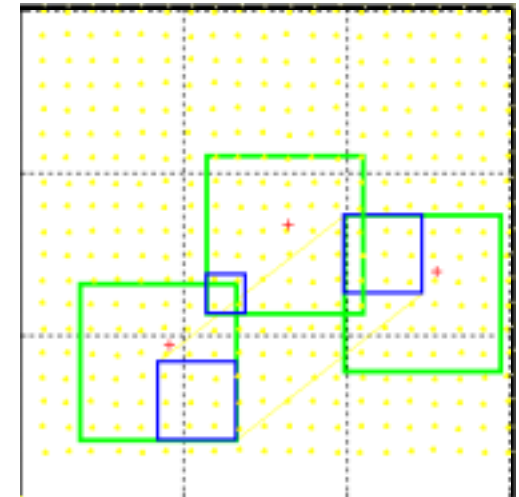
**Approach:** Establish global relation from primitive ones.  
Select sensor to reduce global uncertainty.



Local reason about global structures: "Am I surrounded?"



Relation decomposition and sensor test selection



Hierarchical resolution of relations

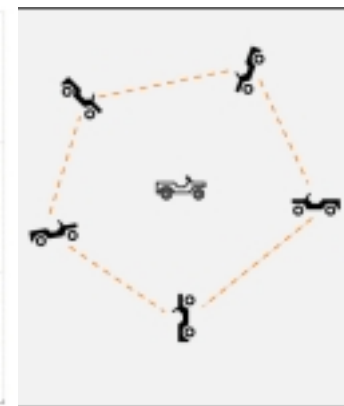
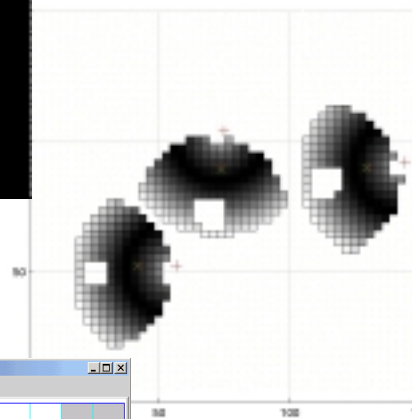
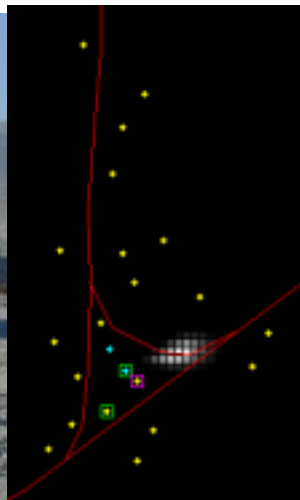
# CoSense Plan for 2002

- Algorithm development
  - Characterize IDSQ tradeoff curves
    - Energy/accuracy/latency vs. sensor density
  - Multi-threaded IDSQ
  - Relational tracking
  - Multiple target tracking
    - Data association and MHM
- Collaboration with other teams
  - Continue to work with Yao/UCLA on beamforming
  - Continue to work with Mitter&Chu/MIT on MHM
  - Collaborate with Estrin/UCLA on geo-routing and in-network processing

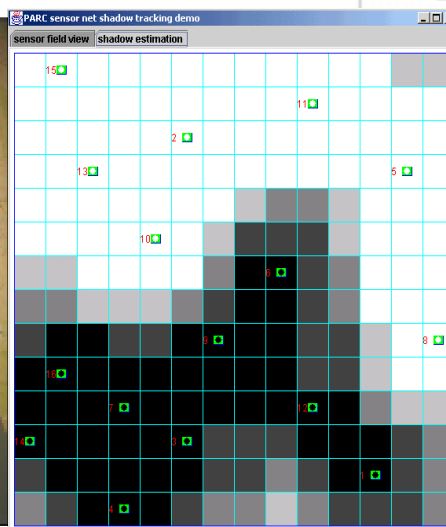
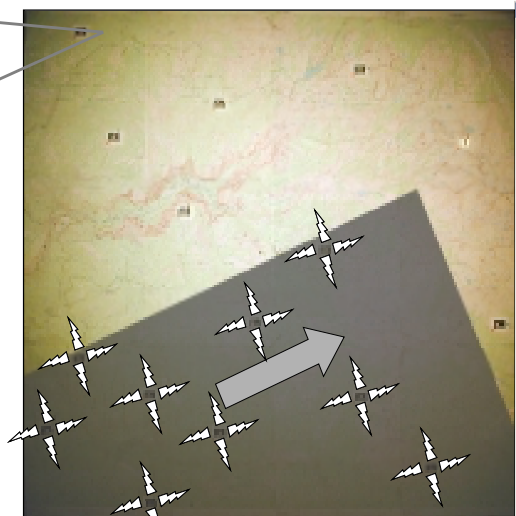
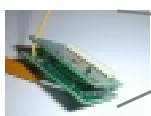
# Demos/posters



IDSQ Tracker Playback Demo



Relational Tracking Poster



Motes Tracking Live Demo

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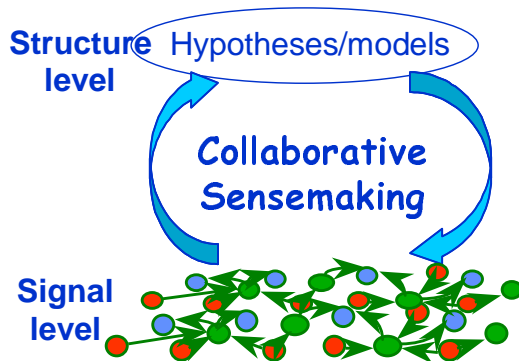
# DARPA CoSense Project:

## Collaborative Sensemaking of Distributed Sensor Data for Target Recognition and Condition Monitoring

### New Ideas

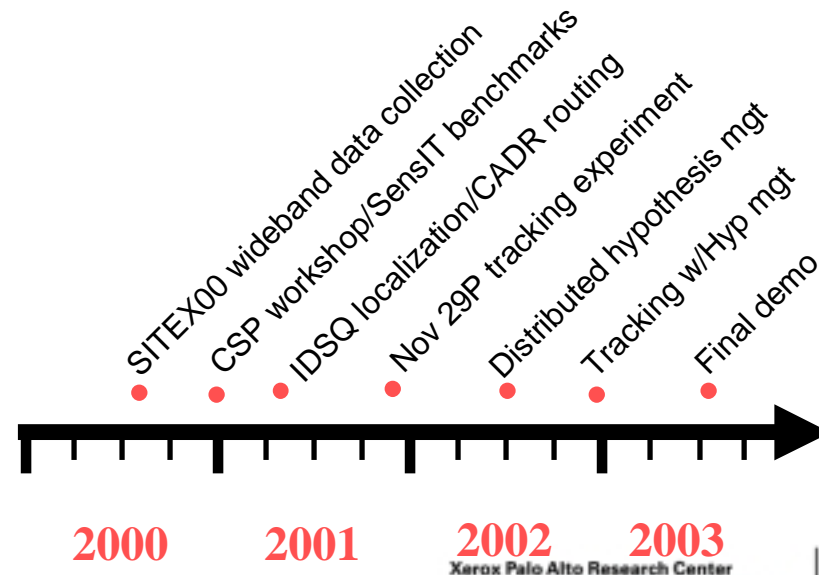
*Blend* signal- and structural-level analysis to enable reliable and timely tracking of non-local spatio-temporal or low-observable events in energy-constrained environment

- Multi-level collaborative signal analysis
- Information-directed sensing and communication



### Impact

- Scalable to realistic target tracking problems
- Accurate, low-latency detection
- Energy-efficient



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